

**ANALYZING DNA SEQUENCES USING CLUSTERING ALGORITHM**

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# **ANALYZING DNA SEQUENCES USING CLUSTERING ALGORITHM**

**A thesis submitted to college Arts & Sciences  
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**By  
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## ABSTRACT

*Data mining gives a bright prospective in DNA sequences analysis through its concepts and techniques. This study carries out exploratory data analysis method to cluster DNA sequences. Feature vectors have been developed to map the DNA sequences to a twelve-dimensional vector in the space. Lysozyme, Myoglobin and Rhodopsin protein families have been tested in this space. The results of DNA sequences comparison among homologous sequences give close distances between their characterization vectors which are easily distinguishable from non-homologous in experiment it with a fixed DNA sequence size that does not exceed the maximum length of the shortest DNA sequence. Global comparison for multiple DNA sequences simultaneously presented in the genomic space is the main advantage of this work by applying direct comparison of the corresponding characteristic vectors distances. The novelty of this work is that for the new DNA sequence, there is no need to compare the new DNA sequence with the whole DNA sequences length, just the comparison focused on a fixed number of all the sequences in a way that does not exceed the maximum length of the new DNA sequence. In other words, parts of the DNA sequence can identify the functionality of the DNA sequence, and make it clustered with its family members.*

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## **DEDICATION**

*To my parents Taleb and Shifa, and to my brothers.*

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## LIST OF ABBREVIATION

A	Adenine
BLAST	Basic Local Alignment Search Tool
bp	Base pairs
C	Cytosine
COI	Cytochrome “C” Oxidase I
D <sub>A</sub>	The distribution of A in the DNA sequence
D <sub>C</sub>	The distribution of C in the DNA sequence
D <sub>G</sub>	The distribution of G in the DNA sequence
DNA	Deoxyribonucleic Acid
D <sub>T</sub>	The distribution of T in the DNA sequence
EM	Expectation-Maximization
FCM	5 Fuzzy C-Means
G	Guanine
GBS	Global Bio-identification System
ILP	Inductive Logic Programming
IR	Information Retrieval
KDD	Knowledge Discovery in Database
KNIES	Kohonen Incorporating Explicit Statistics
LCC	Library of Congress Classification
LVQ	Learning Vector Quantization
MST	Minimal Spanning Tree

$n_A$	Number of instances A in the DNA sequence
$n_C$	Number of instances C in the DNA sequence
NCBI	National Center for Biotechnology Information
$n_G$	Number of instances G in the DNA sequence
NLP	Natural Language Processing
$n_T$	Number of instances T in the DNA sequence
PEs	Processing Elements
RNA	Ribonucleic Acid
SOM	Self Organizing Map
SVMs	Support Vector Machines
T	Thymine
$T_A$	The total distances of A from the origin of DNA sequence
$T_C$	The total distances of C from the origin of DNA sequence
$T_G$	The total distances of G from the origin of DNA sequence
TIS	Translation Initiation Sites
TSP	Travelling Salesman Problem
TSPLIB	Travelling Salesman Problem Library
TSS	Transition Split Site
$T_T$	The total distances of T from the origin of DNA sequence
VQ	Vector Quantization

## **LIST OF APPENDICES**

Appendix

## **CHAPTER ONE**

### **INTRODUCTION**

This chapter introduces a brief description of this study. A general overview of the field of this work, problem statement, the objective and the scope of this study has been presented.

In the last few decades the rapid development of technology reflects to the number of biological data which has been growing in an exponential curve, from Gene Bank ([www.ncbi.nlm.nih.gov](http://www.ncbi.nlm.nih.gov)) site the growth falls down in Fig.1.1. GenBank in 1982 had only 606 sequences with 680,338 bp (base pairs). In year 1992, GenBank contained 78,608 sequences with 101,008,486 bp. By the end of year 2002, GenBank had 22,318,883 sequences with 28,507,990,166 bp. This number had almost doubled in only two years. By the end of year 2008, GenBank had 98,868,465 sequences with 99,116,431,942 bp. Efficient and highly computational tools are needed to analyze the massive amount of data that contains rich information.



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